BE

# Wethodical Accelerator Design 

Overview of "Next Generation"
FCCIS WP2 - GERNE

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1si December 2021

## MAD-NG objectives

- Long term design: easy to use and extend.
$\Rightarrow$ Flexible language $\ln$ fast, simple, and general purpose scripting language.
- $\sim 70 \%$ of the code is written in the scripting language, $\sim 30 \%$ in C .
$\Rightarrow$ Flexible technologies ${ }^{\|+\infty}$ self-contained, all-in-one and modular.
- single application, no dependencies (except Gnuplot for plotting).
$\Rightarrow$ Efficient \& Portable technologies
- same results everywhere (LNX, OSX, WIN), extensive unit tests (>8000).
- fast and extremely simple Foreign Function Interface to C, C++, Fortran, etc...
- 6D PTC physics using GTPSA (for DA) and symplectic integrators.
- slicing, combined physics, combined elements, support/development for extensions is easy...
- Development open source.
$\Rightarrow$ GitHub https://github.com/MethodicalAcceleratorDesign/MAD
$\Rightarrow$ License GPL V3, User manual (~180p, covers <20\%), Programmer Manual (29p).


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## MAD-NG schematic layout

- Built from the start as a platform to develop \& benchmark physics.
$\Rightarrow$ Everything is accessible, modifiable and extensible by users from scripts (e.g. even at runtime).



## MAD-NG ecosystem

Beams
Department

| Legend |  |  |  |
| :--- | :--- | :--- | :--- |
| $A$ exposes $B$ | $A$ is- $a$ | $B$ |  |
| $A$ | $A$ uses $B$ |  |  |
|  |  | Done | Dev |



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## MAD-NG ecosystem

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| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |


SPS: LINE = (6*SUPER);
SPS: LINE = (6*SUPER);
SUPER: LINE = (7*P44,INSERT,7*P44);
SUPER: LINE = (7*P44,INSERT,7*P44);
INSERT: LINE = (P24,2*P00,P42);
INSERT: LINE = (P24,2*P00,P42);
P00: LINE = (QF,DL,OD,DL);
P00: LINE = (QF,DL,OD,DL);
P24: LINE = (QF,DM,2*B2,DS,PD);
P24: LINE = (QF,DM,2*B2,DS,PD);
P42: LINE = (PF,QD,2*B2,DM,DS);
P42: LINE = (PF,QD,2*B2,DM,DS);
P44: LINE = (PF,PD);
P44: LINE = (PF,PD);
PD: LINE = (QD,2*B2,2*B1,DS);
PD: LINE = (QD,2*B2,2*B1,DS);
PF: LINE = (QF,2*B1,2*B2,DS);
PF: LINE = (QF,2*B1,2*B2,DS);

| pf | bline \{qf, $2 * \mathrm{~b} 1,2 * \mathrm{~b} 2, \mathrm{ds}$ \} |
| :---: | :---: |
| pd | $=\mathrm{bline}\{\mathrm{qd,2*b2,2*b1,ds} \mathrm{\}}$ |
| p24 | $=\mathrm{bline}\{\mathrm{qf}, \mathrm{dm}, 2 * \mathrm{~b} 2, \mathrm{ds}, \mathrm{pd}\}$ |
| p42 | $=\mathrm{bline}\{\mathrm{pf}, \mathrm{qd}, 2 * \mathrm{~b} 2, \mathrm{dm}, \mathrm{ds}$ \} |
| p00 | $=\mathrm{bline}$ \{qf,dl,qd,dl\} |
| p44 | = bline $\{\mathrm{pf}, \mathrm{pd}\}$ |
| insert | $=$ bline $\{\mathrm{p} 24,2 * p 00, \mathrm{p} 42\}$ |
| super | $=$ bline \{7*p44,insert,7*p44\} |
| SPS | $=$ sequence 'SPS' \{6*super\} |

## SPS in MAD-NG

## Sequences \& elements

- Lattices definition as in MAD-X (syntax is very close)
$\Rightarrow$ sequences are both containers (e.g. access elements) and table (store arbitrary objects).
- e.g. to store their beam or their own list of knobs.
$\Rightarrow$ elements are both containers (e.g. access attributes) and table (store arbitrary objects).
$\Rightarrow$ sequence can include subsequences, beam lines and elements (and subelements).
$\Rightarrow$ operator overloading (+, -, *) allows to mix lines and sequences descriptions arbitrarily.
$\Rightarrow$ names are optional and can be non-unique with support for relative or absolute counts.
- positions 'AT' can be absolute or relative 'FROM' names with absolute or relative counts.



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Beams Department

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$\Rightarrow$ names are optional and can be non-unique with support for relative or absolute counts.
- positions 'AT' can be absolute or relative 'FROM' names with absolute or relative counts.
- Manage arbitrary number of sequences to allow simulation of entire accelerators complex.
$\Rightarrow$ Shared sequences, e.g. LHCB1 and LHCB2.
- provides few sharing policies.
$\Rightarrow$ Chained sequences, e.g. PSB, PS, SPS and BTL.

$\Rightarrow$ Conditionally chained sequences (e.g. RaceTrack).
- e.g. Booster
- based on special s-link element
- connections and conditions are performed through an arbitrary user-defined function.



## Sequences conversion (MAD-X to MAD)

- MAD-NG loads and convert MAD-X sequences, elements and variables, including deferred expressions, on-the-fly into the MADX environment (a MAD-NG context that emulates MAD-X global workspace) and/or save conversion to files.

```
! convert MAD-X files on need, save to MAD file (disk), load to MADX environment (memory)
MADX:load('lhc_as-built.seq' , 'lhc_as-built.mad')
MADX:load('opticsfile.22_ctpps2' , 'opticsfile.22_ctpps2.mad')
MADX:load("FCCee_z_213_nosol_18.seq", "FCCee_z_213_nosol_18.mad")
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- MAD-NG embeds technologies to parse arbitrary language that can be described with PEG (parser expression grammar) to generate AST (abstract syntax tree), and apply transformations and/or evaluations.

(e.g. MAD-X dictionary \& tables columns)


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- MAD-NG embeds technologies to parse arbitrary language that can be described with PEG (parser expression grammar) to generate AST (abstract syntax tree), and apply transformations and/or evaluations.

- MAD-NG allows to run MAD-X as a module to convert sequences, elements and variables into MADX environment as with CpyMad. But this method does not propagate the deferred expressions, i.e. lattice logic is lost (fine for a "static" description). Could be propagated with some extra work.




```
plot {
    sequence = {lhcb1,lhcb2},
    laypos = "in",
    layonly = false,
    title = "Layout in plot",
    prolog = 'set size ratio -1',
    scrdump = "plotlhc.gp",
}
```

MAD-X loads the entire ( 2 beamlines, 30000 lines)

MAD-NG loads the entire LHC in MAD-X format and saved it in files in $\sim 1 \mathrm{~s}$.

MAD-NG loads the entire LHC from converted files (.mad files) in $\sim 0.2 \mathrm{~s}$.

Gnuplot script (.gp files) size is 5 MB \& $125000+$ lines and takes $\sim 1$ sec to display.

All items are tagged i.e. moving the mouse over show their name and kind



```
plot {
    sequence = { lhcb1, lhcb2, lhcb1, lhcb2 },
    range = {
        {"E.DS.L1.B1","S.DS.R1.B1"},{"E.DS.L1.B2","S.DS.R1.B2"},
            {"E.DS.L5.B1","S.DS.R5.B1"},{"E.DS.L5.B2","S.DS.R5.B2"},
    },
    laydisty = {
        lhcb2["E.DS.L1.B2"].mech_sep, ! second bline
        -0.4, ! third bline
        -0.4 + lhcb2['E.DS.L5.B2'].mech_sep ! fourth bline
    },
    title = "IP1-IP5 two angled beams",
}
```



```
plot {
    sequence = { lhcb1, lhcb2, lhcb1, lhcb2 },
    range = {
        {"E.DS.L1.B1","S.DS.R1.B1"},{"E.DS.L1.B2","S.DS.R1.B2"},
            {"E.DS.L5.B1","S.DS.R5.B1"},{"E.DS.L5.B2","S.DS.R5.B2"},
    },
    laydisty = {
        lhcb2["E.DS.L1.B2"].mech_sep, ! second bline
        -0.4, ! third bline
        -0.4 + lhcb2['E.DS.L5.B2'].mech_sep ! fourth bline
    },
    title = "IP1-IP5 two angled beams",
}
```

Department

## Track plot (LHCB1 around IP5)




Layout in plot with $\beta_{x}$




## Element tracking: slices, actions \& frames

Beams
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Backward tracking

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Beams
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Forward tracking
Backward tracking

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Department


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```
atentry(elm, m, sdir, -1)
mis (elm, m, sdir)
rot (tlt, m, sdir)
fringe (elm, m, sdir)
track (elm, m, 1 , thick, thin)
fringe (elm, m, -sdir)
rot (tlt, m, -sdir)
mis (elm, m, -sdir)
atexit (elm, m, -sdir, -2)
```



- Misalignments (element to sequence) restore the frame on exit.

Permanent misalignments (element property) don't (i.e. patches).
Survey can consider misalignments (user-policy) for superposition inside elements.

## Survey: sbend tilted by $90^{\circ}-$ dphil $15^{\circ}$ dy 0.1 m

## Survey: sbend tilted by $90^{\circ}$ - dphil $15^{\circ}$ dy 0.1 m

$x, y$ with misalignments, $x r, y r$ reference frame without misalignment


## Survey: sbend tilted by $90^{\circ}$ - dphil $15^{\circ}$ dy 0.1 m

$x, y$ with misalignments, $x r$, $y r$ reference frame without misalignment

$\mathrm{BE}^{\text {Beams }}$
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## Tracking actions (Survey, Track, Coifid and Twiss)

- Actions are functions (or objects with function-like semantic).
$\Rightarrow$ MAD-NG functions are first class lexical closures (fun \& env) and can do everything...
- i.e. high order functions that can receive and return multiple arguments.
$\Rightarrow$ actions kinds: atentry, atslice, atexit, ataper, atsave.
$\Rightarrow$ mechanism to customise or extend other commands (e.g. Twiss with Track and Cofind).


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- Actions can be combined with combinators (and selectors).
$\Rightarrow$ chain $\left(f_{1}, f_{2}\right) \quad$ Int $f_{1}()$; return $f_{2}()$.
$\Rightarrow \operatorname{achain}\left(f_{1}, f_{2}\right)$ return $f_{1}()$ and $f_{2}()$.
$\Rightarrow$ ochain( $\left.f_{1}, f_{2}\right)$ "
$\Rightarrow$ compose( $f_{1}, f_{2}$ ) mer return $f_{1}\left(f_{2}()\right)$.
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- Actions can be selected by selectors:
- Selectors are functions to enable/disable actions based on some particular criteria e.g. slices number or any other user-defined criteria.
predefined selectors: atall, atentry, atbegin, atbody, atbound, atend, atexit, atmid, atins, atstd, actionat, action.
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- Actions are triggered by tracking codes (Survey and Track).
$\Rightarrow$ actions are chained so they are independent from each other.
$\Rightarrow$ default for ataper: check for aperture at slice 0 (titled frame).
$\Rightarrow$ default for atsave: save data at exit (reference frame),
and at slices (titled frame) if atslice $=$ ftrue .
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Actions are a powerful tool to extend tracking codes (survey and track). E.g. connect sequences (or beams) together; replace, extend or wrap computations; add extra physics between multi-particules or damaps, e.g. slices number or any other user-defined crit
atbound, atend, atexit,
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Order of execution at each slice

| atslice = ftrue |
| :---: |
| atbegin and ataper |
| and ataper (user) |
| atsave (track) |
| and atsave (twiss) |
| and atsave (user) |

and at slices (titled frame) if atslice $=$ ftrue.

## Track in "depth" : user-defined possible extensions

BE

Sequence
Element
Integrator
Maps

## Track in "depth" : user-defined possible extensions



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## Track in "depth" : user-defined possible extensions



Integrator

## Track in "depth" : user-defined possible extensions

Sequence


Maps

## Track in "depth" : user-defined possible extensions

BE

Sequence
build mflow
and mtable
run track
main loop


## Track in "depth" : user-defined possible extensions

Sequence


## Track in "depth" : user-defined possible extensions

Sequence
Track
build mflow
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## Physics can be parametrised and/or configured by element attributes and commands attributes

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Physics can be extended by creating new element or modifying existing element or subelements track method (object oriented approach)

## Track in "depth" : user-defined possible extensions



## Physics can be parametrised and/or configured by element attributes and commands attributes

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> Physics can be extended by providing extra integration methods e.g. 3D field maps.

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Physics can be extended by providing new maps or actions e.g. strong beam-beam (functional approach)


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Sequence


Maps


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- 6D PTC physics using GTPSA (for DA) and symplectic integrators.
- slicing, combined physics \& elements, easy support for extensions, etc...
- x4-10 faster than PTC for TPSA tracking, x1-2 slower than MAD-X for most cases.


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- x4-10 faster than PTC for TPSA tracking, x1-2 slower than MAD-X for most cases.
- Survey: geometrical tracking
- Survey supports multi-turns, ranged and step-by-step backtracking and reverse tracking. Return a Survey table and a Survey map flow (tracked context).
- fully compatible with Track for superposition and observable points (e.g. table output, smooth plots, slicing, actions, sub-elements, etc...)
- support exact misalignments and permanent misalignments, and patches.


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- fully compatible with Track for superposition and observable points (e.g. table output, smooth plots, slicing, actions, sub-elements, etc...)
- support exact misalignments and permanent misalignments, and patches.
- Track: dynamical tracking
- Track supports multi-particles or multi-damaps, multi-turns, ranged and step-bystep backtracking and reverse tracking of charged particles to arbitrary DA order and arbitrary number of parameters (few thousands). Return a Track table and a Track map flow (tracked context).
- fully compatible with Survey for superposition and observable points (same tracking engine).
- support exact misalignments, permanent misalignments, multipoles \& field errors for all elements. Can be combined freely with patches.
- symplectic tracking up to 8th order on 5D (delta-p) and 6D (delta-rf) phase space (exact=true, time=true, totalpath e.g. for thick RF).
- provides true thick lens and thin lens tracking model, radiation with photons tracking (disabled in twiss), fringe fields (hard edge for all elements, including solenoid), mutable particles (multiple beams), exact patches (translations, rotations \& time-energy), 4D weak-strong beam-beam (sixtracklib), apertures (all kinds).
- may search for the closed orbit to support relative initial coordinates.


## MAD-NG physics II

- Cofind: fix point search
- Newton-based optimiser running Track with 1st order DA map or 7 particles.
- support final coordinates translation.
- extend Track with actions.


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- Twiss: optics tracking
- runs Cofind (closed orbit) - Track (one-turn map) - Normal - Track (optics) - post processing.
- extend Track with actions to compute on-the-fly optics and fill twiss table (extended track table).
- support coupled optics, dispersions, tunes, chromaticities, synchrotron integrals, momentum compaction factor, phase slip factor, energy gamma transition, etc... support chrom option to compute chromatic derivatives of previous quantities (e.g. Montaigue functions).


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- extend Track with actions to compute on-the-fly optics and fill twiss table (extended track table).
- support coupled optics, dispersions, tunes, chromaticities, synchrotron integrals, momentum compaction factor, phase slip factor, energy gamma transition, etc... support chrom option to compute chromatic derivatives of previous quantities (e.g. Montaigue functions).
- Match: highly configurable optimiser
- on the model of MAD-X use_macro approach, i.e. arbitrary user's setups \& runs.
- provides all kinds of local \& global, linear \& non-linear, optimiser ( $\sim 20$ algorithms).
- very flexible, highly configurable with many physics-oriented setups (not just a penalty-function to minimise).


## MAD-NG physics II

Beams Department

- Cofind: fix point search
- Newton-based optimiser running Track with 1st order DA map or 7 particles.
- support final coordinates translation.
- extend Track with actions.
- Twiss: optics tracking
- runs Cofind (closed orbit) - Track (one-turn map) - Normal - Track (optics) - post processing.
- extend Track with actions to compute on-the-fly optics and fill twiss table (extended track table).
- support coupled optics, dispersions, tunes, chromaticities, synchrotron integrals, momentum compaction factor, phase slip factor, energy gamma transition, etc... support chrom option to compute chromatic derivatives of previous quantities (e.g. Montaigue functions).
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- Normal: normal forms analysis (under validation)
- provides linear and non-linear parametric normal forms on DA map (used by twiss) to extract RDTs. Can be applied at observable points in Track to track RDTs, either on-the-fly with actions or through post processing of DA maps saved in Track table.


## MAD-NG review

- Performed from Oct. 2020 to Mar. 2021.


## MAD-NG review

- Performed from Oct. 2020 to Mar. 2021.
- Run simple studies on CERN machines and compare results vs MAD-X and MADX-PTC (listed in reverse time order, from last to first).
$\Rightarrow$ Clic 380 GeV BDS optimisation (Andrii Pastushenko, 2 presentations)
- twiss, high order maps generation, beam size comparison.
$\Rightarrow$ MAD-NG outlook for LHC and HL-LHC (Riccardo De Maria)
$\Rightarrow$ MAD-NG in Gantries (Cedric Hernalsteens, not presented)
$\Rightarrow$ Experience with FCC-ee Lattice in MAD-NG (Leon van Riesen-Haupt)
- linear optics, momentum detuning, amplitude detuning, radiation integrals.
$\Rightarrow$ Experience for LHC coupling with MAD-NG (Tobias Persson).
- example in the next slide
$\Rightarrow$ Experience of MAD-NG with the PS (Alexander Huschauer).
- linear optics, dispersions, tunes, chromaticities.
- exploration of model and integration methods.
$\Rightarrow$ Translating MAD-X scripts to MAD-NG (Laurent Deniau).


## MAD-NG studies - LHC coupling with param. maps

```
print("strengths before matching coupling correctors:")
print("sk1r=", MADX.sk1r)
print("sk2r=", MADX.sk2r)
print("sk3r=", MADX.sk3r)
print("sk4r=", MADX.sk4r)
local }\textrm{XO}=\mathrm{ damap {mo=2, nv=6, nk=4, ko=1,
    vn={'x','px','y','py','t','pt',
    'sk1r','sk2r','sk3r','sk4r'}}
-- set knobs: scalar + TPSA -> TPSA
MADX.sk1r = MADX.sk1r + X0.sk1r
MADX.sk2r = MADX.sk2r + X0.sk2r
MADX.sk3r = MADX.sk3r + X0.sk3r
MADX.sk4r = MADX.sk4r + X0.sk4r
local mjac = { ---> variables & knobs
    { var='x' ,'0010001','00100001','001000001','0010000001' }, --
    { var='x' ,'0001001','00010001','000100001','0001000001' }, --
    { var='px','0010001','00100001','001000001','0010000001' }, -- v
    { var='px','0001001','00010001','000100001','0001000001' }, -- constraints
}
status, fmin, ncall = match {
    command := track {sequence=lhcb1, X0=X0, observe=1, savemap=true},
```

Beams
print("strengths before matching coupling correctors:")
print("sk1r=", MADX.sk1r)
print("sk2r=", MADX.sk2r)
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print("sk4r=", MADX.sk4r)
local $\mathrm{XO}=$ damap $\{\mathrm{mo}=2, \mathrm{nv}=6, \mathrm{nk}=4, \mathrm{ko}=1$,

$$
\begin{array}{r}
\text { vn=\{'x','px','y','py','t','pt', } \\
\text { 'sk1r','sk2r', 'sk3r','sk4r'\}\} }
\end{array}
$$

-- set knobs: scalar + TPSA -> TPSA
MADX.sk1r $=$ MADX.sk1r + X0.sk1r
MADX.sk2r $=$ MADX.sk $2 r+$ X0.sk2r
MADX.sk3r $=$ MADX.sk $3 r+$ X0.sk $3 r$
MADX.sk4r $=$ MADX.sk $4 r+$ X0.sk $4 r$
status, fmin, ncall = match \{
command := track \{sequence=lhcb1, $x 0=x 0$, observe=1, savemap=true\},
jacobian = \t,grd,jac => -- gradient not used, fill only jacobian jac:setrow(1..8, t['S.DS.L2.B1'].__map:getm(mjac) ) jac:setrow(9..16, t['E.DS.L2.B1'].__map:getm(mjac) ) end,
variables $=$ \{ rtol=1e-6, -- 1 ppm \{ name='sk1r', get $:=$ MADX.sk1r:get0(), set $=\backslash x$-> MADX.sk1r:set0(x) \}, \{ name='sk2r', get $:=$ MADX.sk2r:get0(), set $=\backslash x \rightarrow$ MADX.sk2r:set0(x) \},
\{ name='sk3r', get $:=$ MADX.sk3r:get0(), set $=\backslash x->$ MADX.sk3r:set0(x) \},
\{ name='sk4r', get := MADX.sk4r:getO(), set = \x -> MADX.sk4r:setO(x) \},
\},
equalities $=\{$
$\{$ expr $=\backslash t$
\{ expr $=$ \t $\rightarrow$ t['S.DS.L2.B1'].__map.x : get'0010', name='S.R11.x' \},
\{ expr = \t $\rightarrow$ t['S.DS.L2.B1'].__map.x :get'0001', name='S.R12.x' \},
\{ expr = \t $\rightarrow$ t['S.DS.L2.B1'].__map.px:get'0010', name='S.R21.x' \},
\{ expr = \t $\rightarrow$ t['S.DS.L2.B1'].__map.px:get'0001', name='S.R22.x' \},
\{ expr = \t -> t['E.DS.L2.B1'].__map.x :get'0010', name='E.R11.x' \},
\{ expr = \t $\rightarrow$ t['E.DS.L2.B1'].__map.x :get'0001', name='E.R12.x' \},
\{ expr $=$ lt $\rightarrow$ t['E.DS.L2.B1'].__map.px:get'0010', name='E.R21.x' \},
\{ expr = \t $\rightarrow$ t['E.DS.L2.B1'].__map.px:get'0001', name='E.R22.x' \},
\},
objective $=\{$ fmin=1e-12 \},
maxcall=100, info=2
\}
-- reset knobs: extract scalar values from TPSA
MADX.sk1r = MADX.sk1r:getO()
MADX.sk2r = MADX.sk2r:getO()
MADX.sk3r = MADX.sk3r:get0()
MADX.sk4r = MADX.sk4r:get0()
print("status=", status, "fmin=", fmin, "ncall=", ncall)
print("strengths after matching coupling correctors:")
print("sk1r=" , MADX.sk1r )
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$$
\begin{array}{r}
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local mjac $=\{--->$ variables \& knobs
\{ var='x' ,'0010001','00100001','001000001', '001000
\{ var='x' ,'0001001','00010001','000100001', '000100
\{ var='px','0010001','00100001','001000001',' 001000
\{ var='px','0001001','00010001','000100001','000100
status, fmin, ncall = match \{
command $:=$ track \{sequence=lhcb1, $x 0=\mathrm{x} 0$, observe=1,

## Timing summary and links to codes:

MAD-X using matrix 1 m 55
MAD-NG using matrix 55 s (15s)
MAD-NG using matrix \& knobs 40s (4.5s)
MADX-PTC using alphas-betas $>40 \mathrm{~m}$

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MADX.sk1r = MADX.sk1r + XO.sk1r
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variables $=$ \{ rtol=1e-6, -- 1 ppm
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status, fmin, ncall = match \{
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## Timing summary and links to codes:

## MAD-X using matrix 1 m 55

MAD-NG using matrix 55 s (15s) MADX-PTC uciemmand performs a Jacobian Match commanalysis on the And
eset knobs: extract scalar values from TPSA
.sk1r = MADX.sk1r:get0()
sk2r = MADX.sk2r:get0()
sk3r = MADX.sk3r:get0()
sk4r = MADX.sk4r:get0() and tags useless con with oversized variables, i.e. starting wins does not set of knobs or con parametric maps! "strengths after matching coupling correctors:") harm when USIIN $\quad \begin{aligned} & \text { print ("sk2r=", MADX.sk2r }) \\ & \text { print("sk3r=", MADX.sk3r })\end{aligned}$
print("sk2r=" , MADX.sk2r )
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- complete unit tests \& manual.
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- On some aspects, MAD-NG is more mature than MAD-X
- better code architecture and structure.
- more flexible and extensible for the physics (new features require day(s)).
- less surprises when combining features (e.g. misalignments and slicing).
- main stream programming language for scripting (save user time!) \& many toolboxes.
- mature technologies, syntax error, backtrace, debugger, profiler, JIT (save user time!).
- some features have been back ported to MAD-X (e.g. permanent misalignment, patches) or will be (fringe fields, combined/overlapping elements).
- support backtracking, charged particles, parallel sequences, useful for e.g. matching IPs, no need for reverse sequence, etc...


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## THANK YOU FOR YOUR ATTENTION

## Lua overview (httip://wwwwiluanorg)

## MAD scripting language is based on Lua $5.1+$ (it is a superset of)

about
news
get started
download documentation community contact site map português

Lua 5.3.3
released
Programando em Lua published


Lua Workshop 2016
to be held in San Francisco

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## Lua is a powerful, fast, lightweight, embeddable scripting language.

Lua combines simple procedural syntax with powerful data description constructs based on associative arrays and extensible semantics. Lua is dynamically typed, runs by interpreting bytecode for a register-based virtual machine, and has automatic memory management with incremental garbage collection, making it ideal for configuration, scripting, and rapid prototyping.

Lua has been used in many industrial applications (e.g., Adobe's Photoshop Lightroom), with an emphasis on embedded systems (e.g., the Ginga middleware for digital TV in Brazil) and games (e.g., World of Warcraft and Angry Birds). Lua is currently the leading scripting language in games. Lua has a solid reference manual and there are several books about it. Several versions of Lua have been released and used in real applications since its creation in 1993. Lua featured in HOPL III, the Third ACM SIGPLAN History of Programming Languages Conference, in June 2007. Lua won the Front Line Award 2011 from the Game Developers Magazine.

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## Reference manual is 29 pages!

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LuaJIT is Copyright © 2005-2015 Mike Pall, released under the MIT open source license.

## Compatibility

## Overview

| $\begin{aligned} & 3 x \\ - & 100 x \end{aligned}$ | $115 \text { Vв }$ | $\begin{gathered} 90 \text { кв } \\ \text { JIT } \end{gathered}$ | ${ }^{63 \text { кıoc }}$ | $\begin{gathered} 24 \text { кıoc } \\ \text { ASM } \end{gathered}$ | 11 кцос Lua |
| :---: | :---: | :---: | :---: | :---: | :---: |

LuaJIT has been successfully used as a scripting middleware in games, appliances, network and graphics apps, numerical simulations, trading platforms and many other specialty applications. It scales from embedded devices, smartphones, desktops up to server farms. It combines high flexibility with high performance and an unmatched low memory footprint.

LuaJIT has been in continuous development since 2005. It's widely considered to be one of the fastest dynamic language implementations. It has outperformed other dynamic languages on many crosslanguage benchmarks since its first release - often by a substantial margin.

For LuaJIT 2.0, the whole VM has been rewritten from the ground up and relentlessly optimised for performance. It combines a high-speed interpreter, written in assembler, with a state-of-theart JIT compiler.

An innovative trace compiler is integrated with advanced, SSA-based optimisations and highly tuned code generation backends. A substantial reduction of the overhead associated with dynamic languages allows it to break into the performance range traditionally reserved for offline, static language compilers.

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$$
\begin{aligned}
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& \text { Community is } \sim P y P y
\end{aligned}
$$

## GTPSA in a nutshell

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1 variable $x$ at order $n$ in the neighbourhood of the point $a$ in the domain of the function $f$ :

$$
T_{f}^{n}(x ; a)=f(a)+f^{\prime}(a)(x-a)+\frac{f^{\prime \prime}(a)}{2!}(x-a)^{2}+\ldots+\frac{f^{(n)}(a)}{n!}(x-a)^{n}=\sum_{k=0}^{n} \frac{f_{a}^{(k)}}{k!}(x-a)^{k}
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| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{1}$ | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| $\mathbf{2}$ | 6 | 12 | 20 | 30 | 42 | 56 | 72 | 90 | 110 | 132 | 156 | 182 |
| $\mathbf{3}$ | 12 | 30 | 60 | 105 | 168 | 252 | 360 | 495 | 660 | 858 | 1092 | 1365 |
| $\mathbf{4}$ | 20 | 60 | 140 | 280 | 504 | 840 | 1320 | 1980 | 2860 | 4004 | 5460 | 7280 |
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| $\mathbf{6}$ | 42 | 168 | 504 | 1260 | 2772 | 5544 | 10296 | 18018 | 30030 | 48048 | 74256 | 111384 |
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| $\mathbf{2}$ | 6 | 14 | 30 | 62 | 126 | 254 | 510 | 1022 | 2046 | 4094 | 8190 | 16382 |
| $\mathbf{3}$ | 12 | 39 | 120 | 363 | 1092 | 3279 | 9840 | 29523 | 88572 | 265719 | 797160 | 2391483 |
| $\mathbf{4}$ | 20 | 84 | 340 | 1364 | 5460 | 21844 | 87380 | 349524 | 1398100 | 5592404 | 22369620 | 89478484 |
| $\mathbf{5}$ | 30 | 155 | 780 | 3905 | 19530 | 97655 | 488280 | 2441405 | 12207030 | 61035155 | 305175780 | 1525878905 |
| $\mathbf{6}$ | 42 | 258 | 1554 | 9330 | 55986 | 335922 | 2015538 | 12093234 | 72559410 | 435356466 | 2612138802 | 15672832818 |
| $\mathbf{7}$ | 56 | 399 | 2800 | 19607 | 137256 | 960799 | 6725600 | 47079207 | 329554456 | 2306881199 | 16148168400 | 113037178807 |
| $\mathbf{8}$ | 72 | 584 | 4680 | 37448 | 299592 | 2396744 | 19173960 | 153391688 | 1227133512 | 9817068104 | 78536544840 | 628292358728 |

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| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{1}$ | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| $\mathbf{2}$ | 6 | 12 | 20 | 30 | 42 | 56 | 72 | 90 | 110 | 132 | 156 | 182 |
| $\mathbf{3}$ | 12 | 30 | 60 | 105 | 168 | 252 | 360 | 495 | 660 | 858 | 1092 | 1365 |
| $\mathbf{4}$ | 20 | 60 | 140 | 280 | 504 | 840 | 1320 | 1980 | 2860 | 4004 | 5460 | 7280 |
| $\mathbf{5}$ | 30 | 105 | 280 | 630 | 1260 | 2310 | 3960 | 6435 | 10010 | 15015 | 21840 | 30940 |
| $\mathbf{6}$ | 42 | 168 | 504 | 1260 | 2772 | 5544 | 10296 | 18018 | 30030 | 48048 | 74256 | 111384 |
| $\mathbf{7}$ | 56 | 252 | 840 | 2310 | 5544 | 12012 | 24024 | 45045 | 80080 | 136136 | 222768 | 352716 |
| $\mathbf{8}$ | 72 | 360 | 1320 | 3960 | 10296 | 24024 | 51480 | 102960 | 194480 | 350064 | 604656 | 1007760 |

DA map: $v\binom{n+v}{v}$

| $v$ \n | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| 2 | 6 | 14 | 30 | 62 | 126 | 254 | 510 | 1022 | 2046 | 4094 | 8190 | 16382 |
| 3 | 12 | 39 | 120 | 363 | 1092 | 3279 | 9840 | 29523 | 88572 | 265719 | 797160 | 2391483 |
| 4 | 20 | 84 | 340 | 1364 | 5460 | 21844 | 87380 | 349524 | 1398100 | 5592404 | 22369620 | 89478484 |
| 5 | 30 | 155 | 780 | 3905 | 19530 | 97655 | 488280 | 2441405 | 12207030 | 61035155 | 305175780 | 1525878905 |
| 6 | 42 | 258 | 1554 | 9330 | 55986 | 335922 | 2015538 | 12093234 | 72559410 | 435356466 | 2612138802 | 15672832818 |
| 7 | 56 | 399 | 2800 | 19607 | 137256 | 960799 | 6725600 | 47079207 | 329554456 | 2306881199 | 16148168400 | 113037178807 |
| 8 | 72 | 584 | 4680 | 37448 | 299592 | 2396744 | 19173960 | 153391688 | 1227133512 | 9817068104 | 78536544840 | 628292358728 |

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| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{1}$ | $\mathbf{2}$ | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| $\mathbf{2}$ | 6 | 12 | 20 | 30 | 42 | 56 | 72 | 90 | 110 | 132 | 156 | 182 |
| $\mathbf{3}$ | 12 | 30 | 60 | 105 | 168 | 252 | 360 | 495 | 660 | 858 | 1092 | 1365 |
| $\mathbf{4}$ | 20 | 60 | 140 | 280 | 504 | 840 | 1320 | 1980 | 2860 | 4004 | 5460 | 7280 |
| $\mathbf{5}$ | 30 | 105 | 280 | 630 | 1260 | 2310 | 3960 | 6435 | 10010 | 15015 | 21840 | 30940 |
| $\mathbf{6}$ | 42 | 168 | 504 | 1260 | 2772 | 5544 | 10296 | 18018 | 30030 | 48048 | 74256 | 111384 |
| $\mathbf{7}$ | 56 | 252 | 840 | 2310 | 5544 | 12012 | 24024 | 45045 | 80080 | 136136 | 222768 | 352716 |
| $\mathbf{8}$ | 72 | 360 | 1320 | 3960 | 10296 | 24024 | 51480 | 102960 | 194480 | 350064 | 604656 | 1007760 |

DA map: $v\binom{n+v}{v}$

| $v$ \n | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| 2 | 6 | 14 | 30 | 62 | 126 | 254 | 510 | 1022 | 2046 | 4094 | 8190 | 16382 |
| 3 | 12 | 39 | 120 | 363 | 1092 | 3279 | 9840 | 29523 | 88572 | 265719 | 797160 | 2391483 |
| 4 | 20 | 84 | 340 | 1364 | 5460 | 21844 | 87380 | 349524 | 1398100 | 5592404 | 22369620 | 89478484 |
| 5 | 30 | 155 | 780 | 3905 | 19530 | 97655 | 488280 | 2441405 | 12207030 | 61035155 | 305175780 | 1525878905 |
| 6 | 42 | 258 | 1554 | 9330 | 55986 | 335922 | 2015538 | 12093234 | 72559410 | 435356466 | 2612138802 | 15672832818 |
| 7 | 56 | 399 | 2800 | 19607 | 137256 | 960799 | 6725600 | 47079207 | 329554456 | 2306881199 | 16148168400 | 113037178807 |
| 8 | 72 | 584 | 4680 | 37448 | 299592 | 2396744 | 19173960 | 153391688 | 1227133512 | 9817068104 | 78536544840 | 628292358728 |

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| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{1}$ | $\mathbf{2}$ | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 |
| $\mathbf{2}$ | 6 | 12 | 20 | 30 | 42 | 56 | 72 | 90 | 110 | 132 | 156 | 182 |
| $\mathbf{3}$ | 12 | 30 | 60 | 105 | 168 | 252 | 360 | 495 | 660 | 858 | 1092 | 1365 |
| $\mathbf{4}$ | 20 | 60 | 140 | 280 | 504 | 840 | 1320 | 1980 | 2860 | 4004 | 5460 | 7280 |
| $\mathbf{5}$ | 30 | 105 | 280 | 630 | 1260 | 2310 | 3960 | 6435 | 10010 | 15015 | 21840 | 30940 |
| $\mathbf{6}$ | 42 | 168 | 504 | 1260 | 2772 | 5544 | 10296 | 18018 | 30030 | 48048 | 74256 | 111384 |
| $\mathbf{7}$ | 56 | 252 | 840 | 2310 | 5544 | 12012 | 24024 | 45045 | 80080 | 136136 | 222768 | 352716 |
| $\mathbf{8}$ | 72 | 360 | 1320 | 3960 | 10296 | 24024 | 51480 | 102960 | 194480 | 350064 | 604656 | 1007760 |

DA map: $v\binom{n+v}{v}$

| $v$ \n | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 2 | 3 | 4 | 5 | 6 | 7 | $8{ }^{\circ}$ | 9 | 10 | 11 | 12 | 13 |
| 2 | 6 | 14 | 30 | 62 | 126 | 254 | - 510 | 1022 | 2046 | 4094 | 8190 | 16382 |
| 3 | 12 | 39 | 120 | 363 | 1092 | 3279 ${ }^{\circ}$ | 9840 | 29523 | 88572 | 265719 | 797160 | 2391483 |
| 4 | 20 | 84 | 340 | 1364 | 5460 | 2 *844 | 87380 | 349524 | 1398100 | 5592404 | 22369620 | 89478484 |
| 5 | 30 | 155 | 780 | 3905 | 19530. | 97655 | 488280 | 2441405 | 12207030 | 61035155 | 305175780 | 1525878905 |
| 6 | 42 | 258 | 1554 | 9330 | 55986 | 335922 | 2015538 | 12093234 | 72559410 | 435356466 | 2612138802 | 15672832818 |
| 7 | 56 | 399 | 2800 | 19607 | 137256 | 960799 | 6725600 | 47079207 | 329554456 | 2306881199 | 16148168400 | 113037178807 |
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| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
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| $\mathbf{7}$ | 56 | 252 | 840 | 2310 | 5544 | 12012 | 24024 | 45045 | 80080 | 136136 | 222768 | 352716 |
| $\mathbf{8}$ | 72 | 360 | 1320 | 3960 | 10296 | 24024 | 51480 | 102960 | 194480 | 350064 | 604656 | 1007760 |

DA map: $v\binom{n+v}{v}$


Matrix: $\sum_{k=0}^{n} v^{k+1}=\frac{v\left(v^{n+1}-1\right)}{v-1}$

| $v \backslash n$ | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 2 | 3 | 4 | 5 | 6 | 7 | $8{ }^{\circ}$ | 9 | 10 | 11 | 12 | 13 |
| 2 | 6 | 14 | 30 | 62 | $126^{\prime}$ | 254 | - 510 | 1022 | 2046 | 4094 | 8190 | 16382 |
| 3 | 12 | 39 | 120 | 363 | 1092 | 3279 ${ }^{\circ}$ | 9840 | 29523 | 88572 | 265719 | 797160 | 2391483 |
| 4 | 20 | 84 | 340 | 1364 | 5460 | 2 +8844 | 87380 | 349524 | 1398100 | 5592404 | 22369620 | 89478484 |
| 5 | 30 | 155 | 780 | 390, | 19530. | 97655 | 488280 | 2441405 | 12207030 | 61035155 | 305175780 | 1525878905 |
| 6 | 42 | 258 | 1554 | 9330 | 55986 | 335922 | 2015538 | 12093234 | 72559410 | 435356466 | 2612138802 | 15672832818 |
| 7 | 56 | 399 | 2800 | 19607 | 137256 | 960799 | 6725600 | 47079207 | 329554456 | 2306881199 | 16148168400 | 113037178807 |
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| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathbf{1}$ | 2 | 3 | 4 | 5 | 6 | 7 | $\mathbf{8}$ | 9 | 10 | 11 | 12 | 13 |
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| $v \backslash n$ | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 2 | 3 | 4 | 5 | 6 | 7 | $8{ }^{\circ}$ | 9 | 10 | 11 | 12 | 13 |
| 2 | 6 | 14 | 30 | 62 | 126 | 254 | - 510 | 1022 | 2046 | 4094 | 8190 | 16382 |
| 3 | 12 | 39 | 120 | 363 | 1092 | 3279* | 9840 | 29523 | 88572 | 265719 | 797160 | 2391483 |
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## GTPSA performance (vst Berz and Yang))



Fig. 5: Relative performance of multiplications.


Fig. 2: Relative performance of indexing furnctions.


Fig. 6: Relative performance of the compositions.


Fig. 4: Relative performance of multiplication at order 2 when using GTPSA with 6 variables and many knobs v. homogeneous TPSA.

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